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2017-04-12

# Innovative Experimentation Enables Effective Employment of Unmanned Systems [video]

Sanchez, Susan

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# INNOVATIVE EXPERIMENTATION enables effective employment of unmanned systems

Susan M. Sanchez and Thomas W. Lucas

SEED Center for Data Farming  
Operations Research Department  
Naval Postgraduate School



# Data Mining vs. Data Farming



- Miners seek valuable buried nuggets
  - Miners have no control over what's there or how hard it is to separate it out
  - Data Mining seeks valuable information buried within massive amounts of data
- Farmers cultivate to maximize yield
  - Farmers manipulate the environment to their advantage: pest control, irrigation, fertilizer, etc.
  - Data Farming manipulates simulation models to advantage with designed experimentation



# Bottom Line Up Front

- Complex, high-dimensional models underpin many important decisions in DoD and beyond.
  - Computational models of physical systems
  - Simulation models of military operations
- Recent breakthroughs enable researchers to gain much more information from these models...this is what SEED is all about!
- New data farming applications: applied research (student theses)
- New data farming methods
- Data farming workshops / educational outreach



# Recent and current theses exploring unmanned systems



- LT John Tanalega, U.S. Navy (March 2018), Distributed lethality, possibly exploring adaptive force packages with and without a medium displacement unmanned surface vehicle (MDUSV)
- CPT Elle Ekman, U.S. Marine Corps (June 2017), Simulating sustainment for an unmanned logistic system concept of operation in support of distributed operations
- LCDR Kevin Solem, U.S. Navy (March 2017), Quantifying the potential benefits of anti-submarine warfare (ASW) continuous trail unmanned vessels (ACTUV) in a tactical ASW scenario (UNCLAS/Restricted distribution)
- CPT Sangbum Kim, Republic of Korea Army (March 17), Feasibility analysis of UAV technology to improve tactical surveillance in South Korea's rear area operations



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TechCon: overview  
on Tuesday 11 April  
by CPT Ekman



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- CDR Melvin Cheang, Singapore Navy (Sep 2016), Operational Energy Capability Portfolio for Protection of Maritime Forces against Small Boat Swarms
- CDR Kevin Williams, U.S. Navy (Sep 2016), Exploring Options for Adding a Magnetic Anomaly Detection (MAD) Capability to the P-8A
- LT Hank Villatoro, U.S. Navy (March 2016), "High Energy Laser Employment in Self Defense Tactics on Naval Platforms in a Complex Air Threat Environment" (RESTRICTED)
- LT John Burns, U.S. Navy (Sep 2015), "Validating a TACMEMO Using Massive Agent-Based Simulation" (RESTRICTED)





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**CRUSER**  
presentation,  
January 2017



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## Researchers:

- CDR Mevin Cheang, Singapore Navy

**Background:** The small boat swarm is a likely asymmetric threat to naval conventional warfare missions. An operational energy (OE) efficient capability portfolio is needed to ensure operational reach and endurance.

## Research questions:

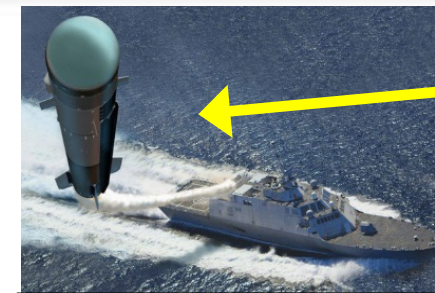
- How effective is force protection, so the naval force can continue on its primary mission?
- How do OE consideration constrain the naval forces' options?
- What operational and doctrinal mitigation policies can be applied?
- What are cost-effective options for defending against this threat?

## Approach:

- Create a simulation in MANA (agent-based modeling platform)
- Use a designed experiment to investigate various scenarios, based on the critical operational issues and research questions
- Assess different capability portfolio options

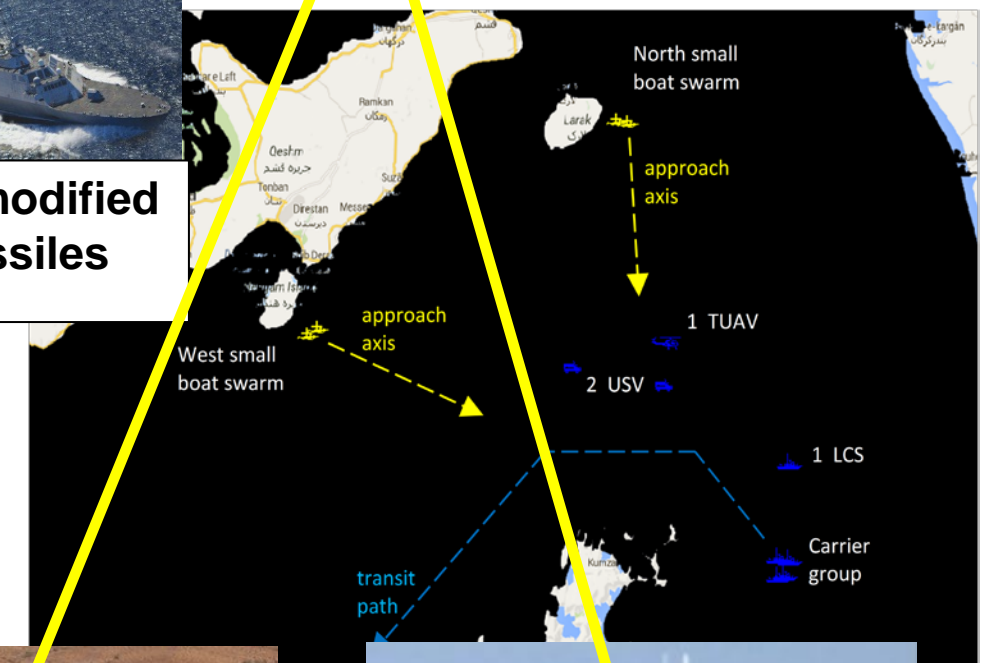
## Findings:

- Efficient mixes of LCS, USVs, and TUAVs are critical



**LCS with modified Hellfire missiles**  
(from Eshel 2015)

## Assets in portfolio

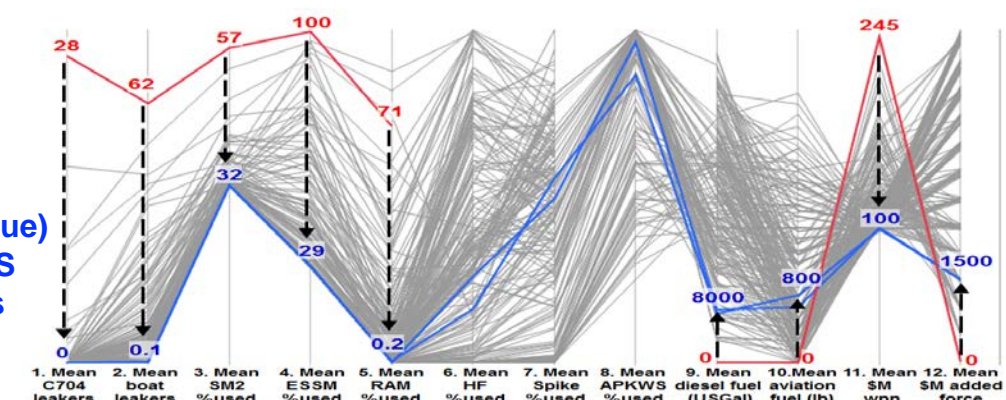


**Firescout MQ-8B TUAV**  
(from Osborn 2013)



**Autonomous 11m USV with Spike LR missile**  
(from Defense-Aerospace 2012)

**Baseline (red)** results in more leakers, higher weapons \$ than **alternatives (blue)** involving 3 LCS with 5-6 TUAVs





## Researchers:

– LT Michael Schambach, USN

**Background:** The German torpedo SeaHake mod4 ER has a maximum range of over 75 nautical miles. Understanding how to employ this type of weapon will be beneficial to the U.S. Navy.

## Research questions:

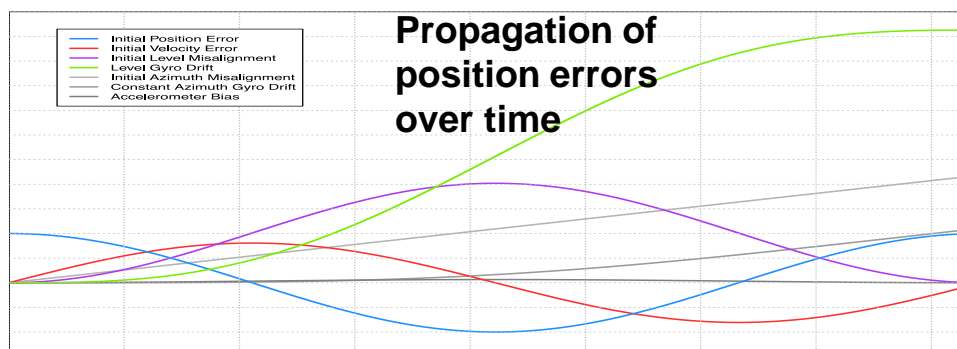
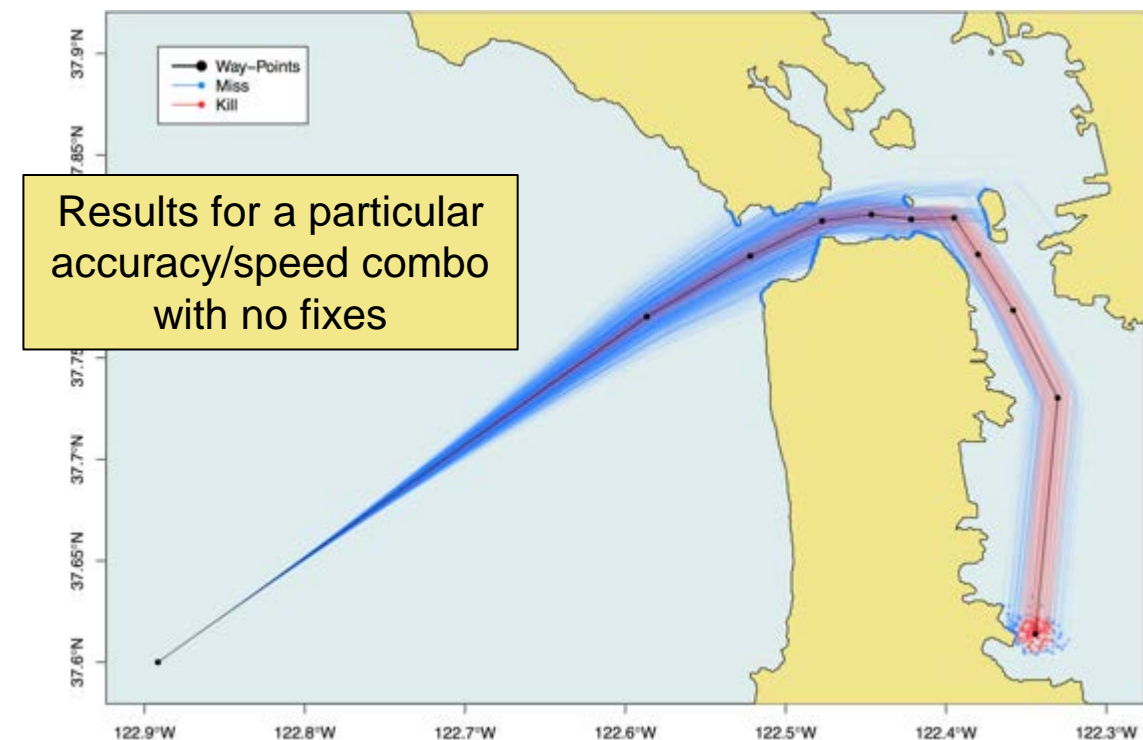
- How can we balance navigation accuracy and detectability to maximize the probability that the long-range torpedo reaches its destination?

## Approach:

- Create a time-step simulation in R to specify the dynamics as the torpedo travels to its target.
- Incorporate three levels of inertial navigation system (INS): low, medium, and high accuracy
- Simulate large numbers of torpedoes, while varying INS and other errors, to assess the kill probability under various conditions
- Explore how the number and location of GPS fixes should change if shore-based radar locations are known



SeaHake Mod4 ER  
Torpedo (*Naval Forces*  
magazine, 2014)

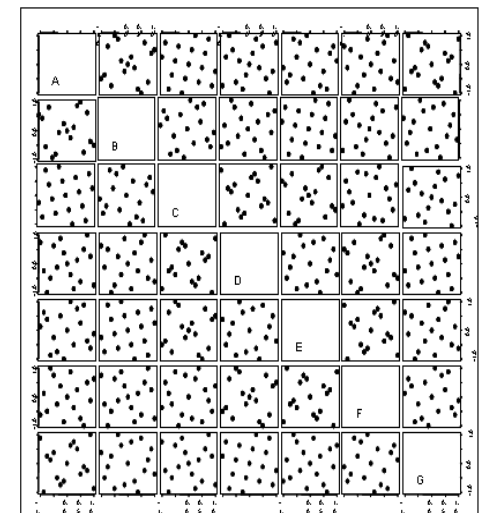
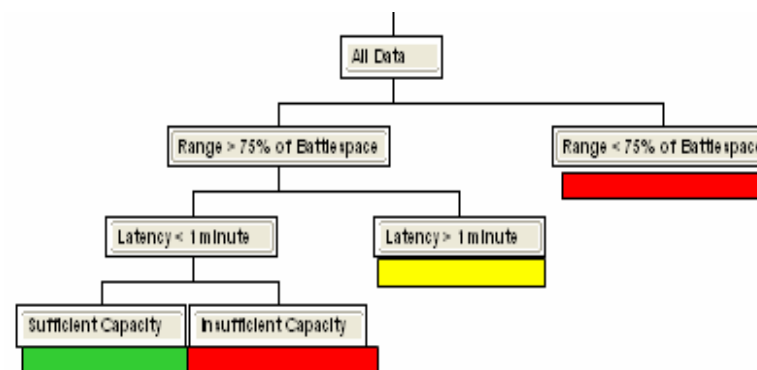


## Findings:

- A robust algorithm calculates the minimum number of fixes, and their locations, unique to the specific scenario modeled.
- Visual interface useful for modifying scenarios, presenting results
- Simulation framework could be applied to other weapon systems, unmanned underwater vehicles (UUVs), and autonomous UVs

# Overview: The SEED Center

- **SEED: Simulation Experiments & Efficient Designs**
- **Specialize in new methods for exploring high-dimensional simulation models**
- **Enabling technologies**
  - New design of experiments
  - High-performance computing
  - Computational models
  - Data mining and visualization
- **Revolution in analysis capabilities**
  - Quick turnaround
  - Variety of broad insights
  - Address uncertainties
  - Robust solutions



**SEED Center Mission:**  
**Make modeling & simulation more effective  
for decision makers**

## Large-scale computational experiments are transformative

*“Petaflop machines like Roadrunner have the potential to fundamentally alter science and engineering...[allowing scientists to] perform experiments that would previously have been impractical.”*

*The New York Times, June 9, 2008*

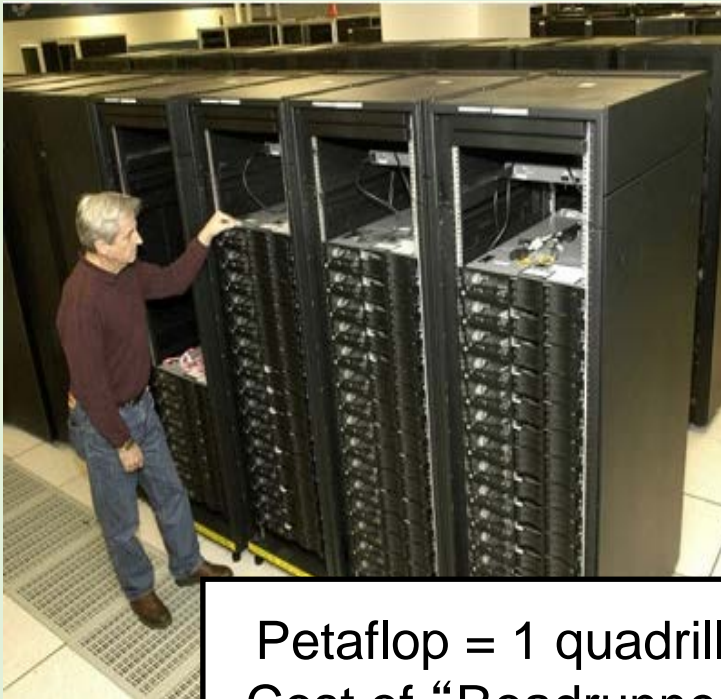
## Experimentation is hard: “ $2^{100}$ is forever”

—Maj Gen Jasper Welch

Even with today’s most powerful computers, brute force exploration of 100 variables at 2 levels for a simulation that runs in one second would take *many times the age of the universe*...so *we need to be smart!*

## Moore’s Law is not enough!

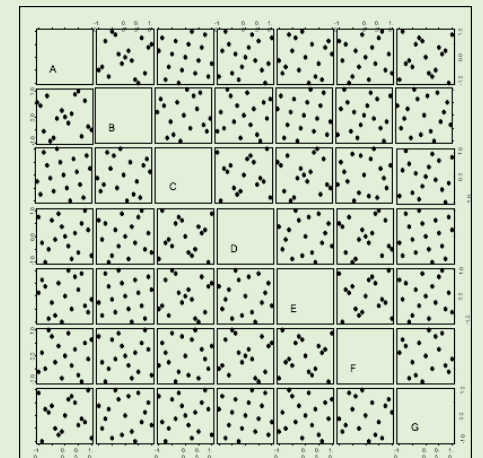
The “curse of dimensionality” cannot be solved by hardware alone.



Petaflop = 1 quadrillion ops/second  
Cost of “Roadrunner” = \$133 million

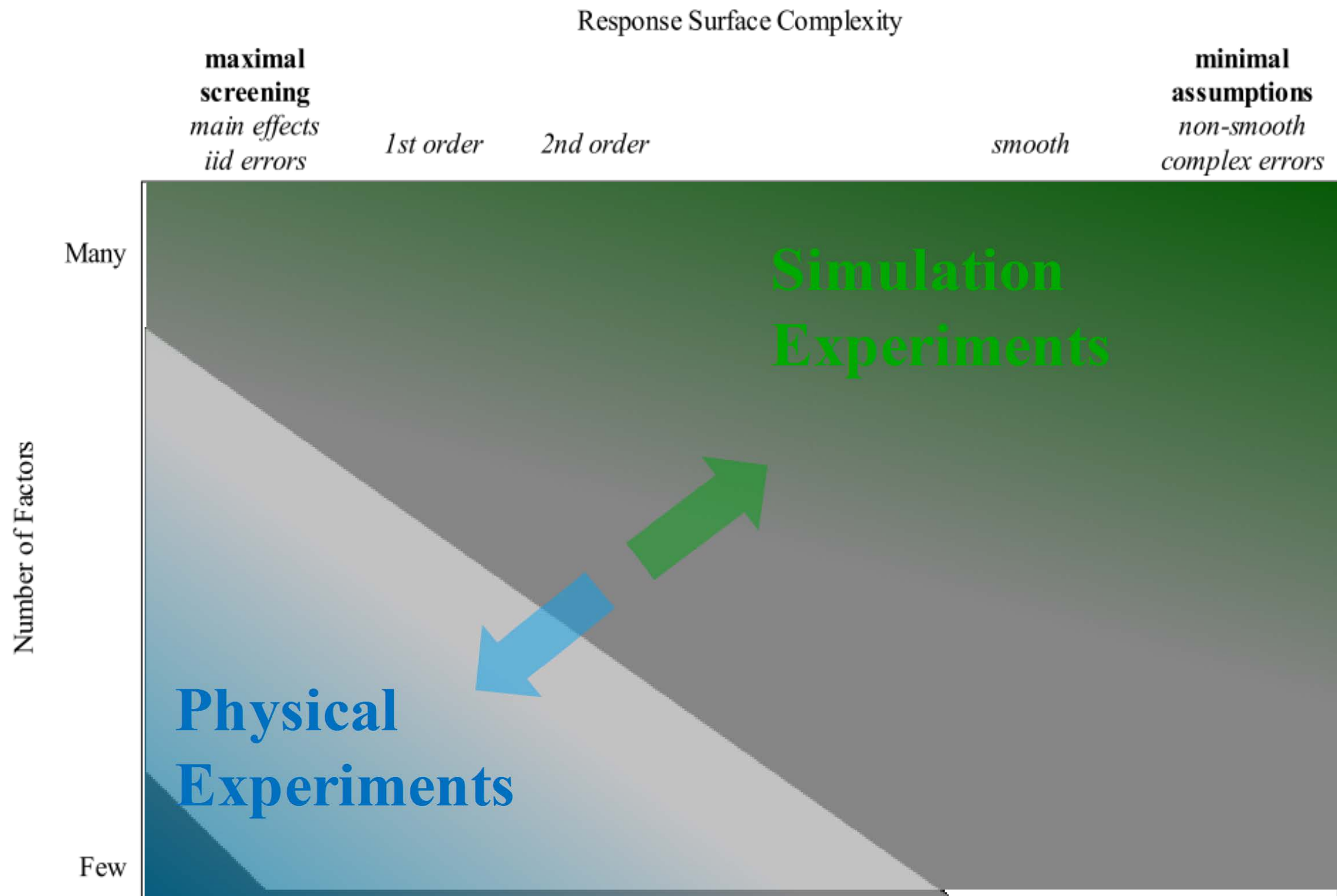
## SEED Center is overcoming the curse of dimensionality...

With large-scale efficient experimental designs, we generate “better big data” and regularly study hundreds of factors for longer-running simulations in hours, days, or weeks on high-performance computing clusters...



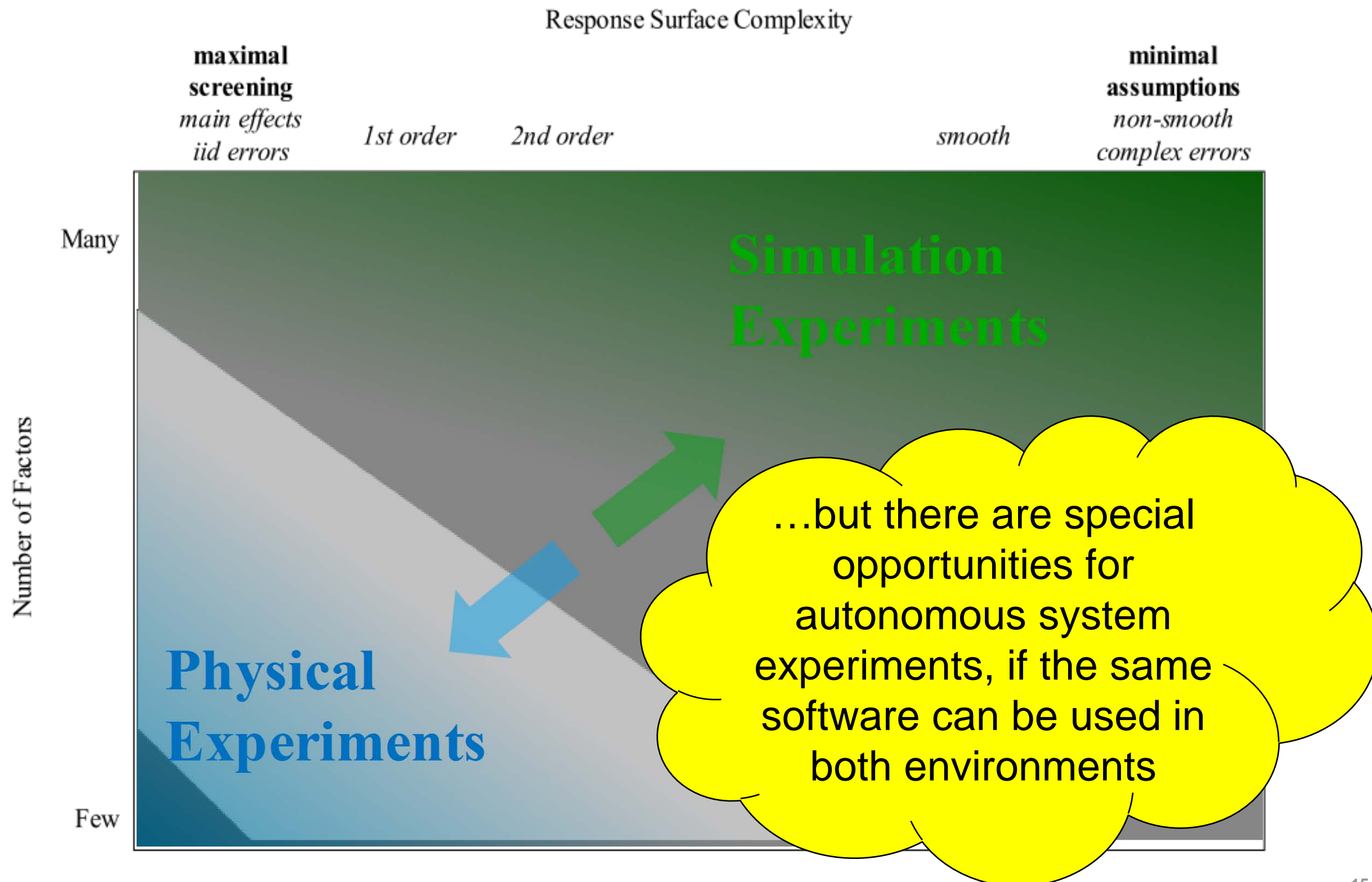


# Simulation is different...



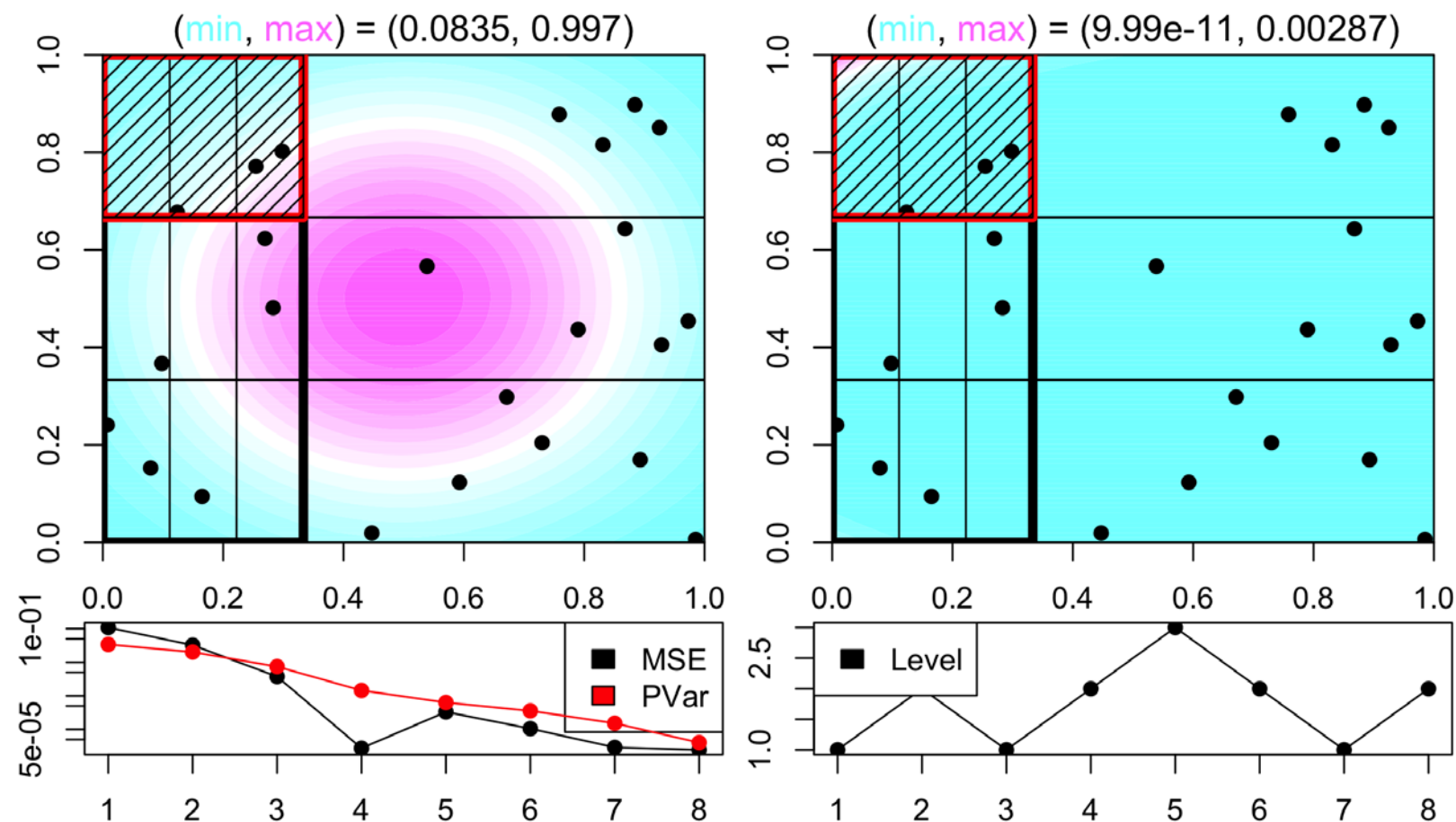


# Simulation is different...



# New methods for design

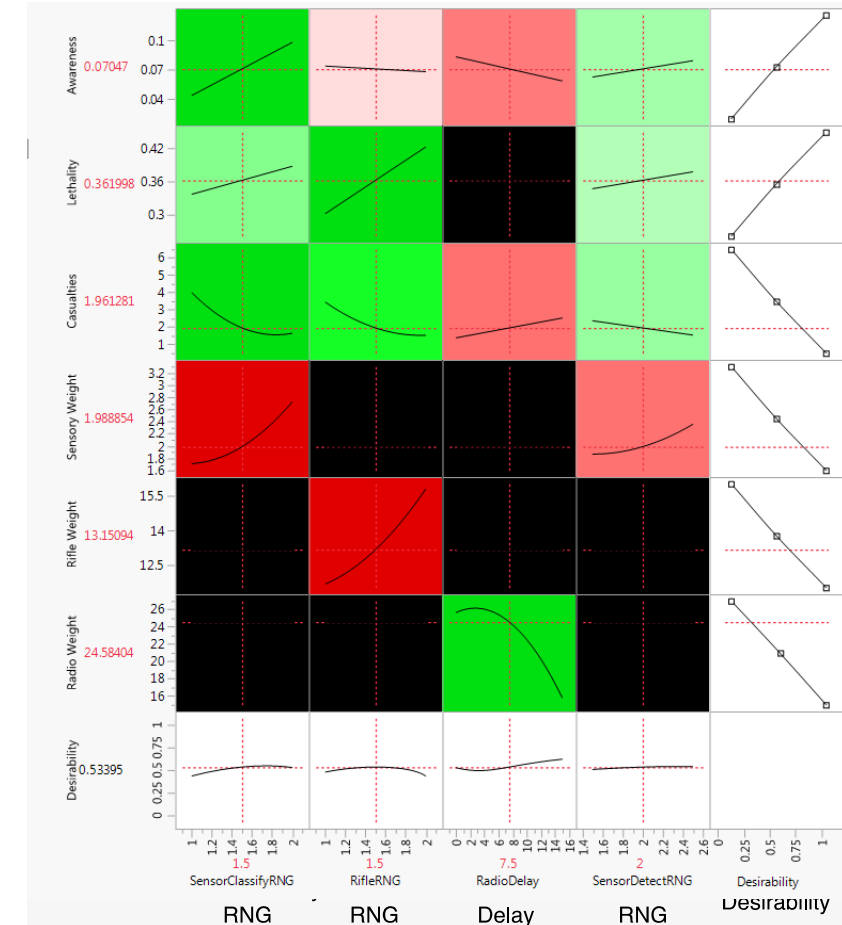
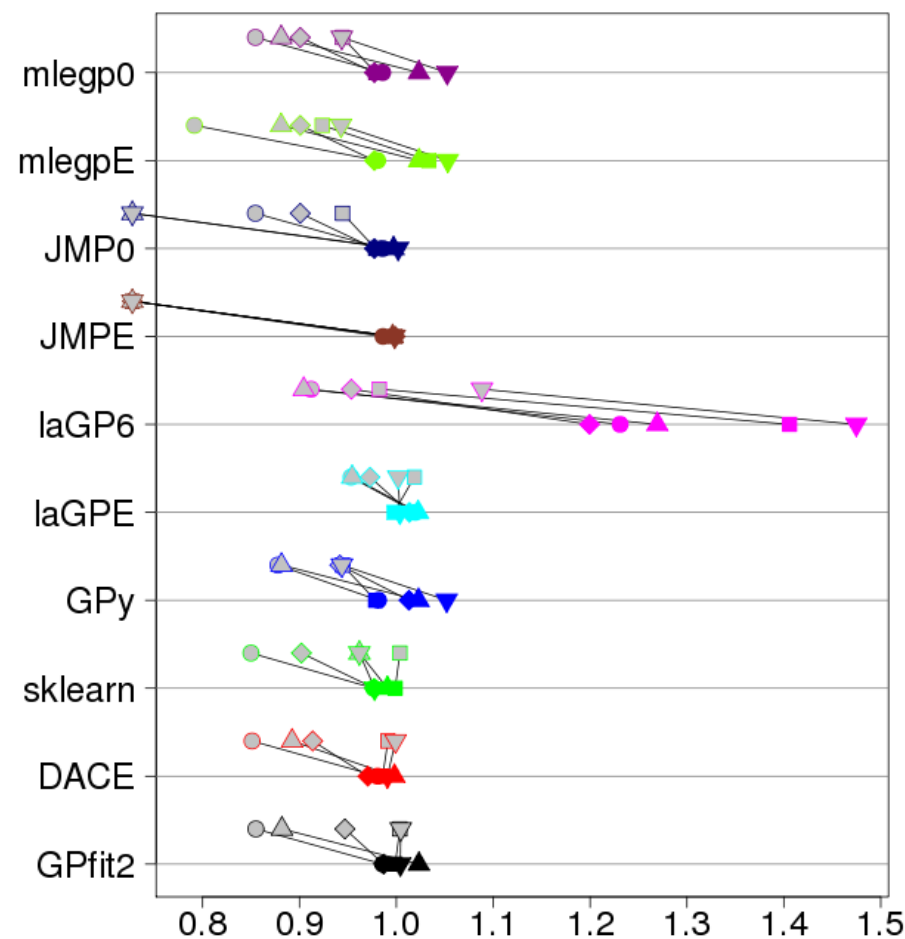
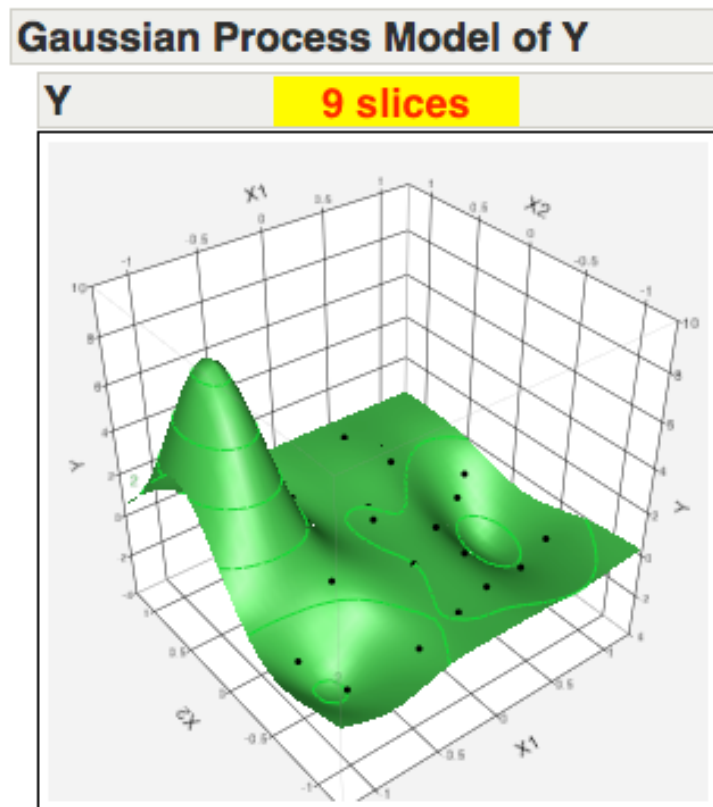
- Adaptive sFFLHD designs: sequential sampling that takes data in “slices” to achieve good design characteristics (space-filling, orthogonality) at various levels – but allow for the simulation experiments to focus first on interesting regions.
  - Goal: get “smart” simulation data on an ongoing basis, vs. one snapshot
  - Work in process (Prof. Susan Sanchez with NREIP Intern/NWU PhD student Collin Erikson, NWU Prof. Bruce Ankenman)



# New methods for analysis

Goal: better understanding of a different class of flexible metamodels (surrogate models of I/O for simulation, as functions of factors)

- Working paper: C. Erickson, B. E. Ankenman, S. M. Sanchez, “Comparison of Gaussian process modeling software” (extended abstract published in WSC ‘16 Proceedings, full paper under 2<sup>nd</sup> review)
- Investigating GP metamodels for use in tradespace analysis, adaptive sequential design procedures



# Data Farming Workshops / Educational Outreach\*

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## ***Completed...***

- ½ day tutorial as part of OCEANS '16 in Monterey, CA  
<http://www.oceans16mtsieeemonterey.org/>  
**Data Farming 101** (Monday morning 19 Sep 2016)
- ½ day tutorial as part of WSC '16 in Washington, D.C.  
<http://www.wintersim.org>  
**Data Farming 101** (Sunday 11 Dec 2016)
- Full day tutorial as part of Science of Test Workshop in Springfield, VA  
**Data Farming 101** (Monday 3 April 2017)
- One week tutorial at Defence Science & Technology group in Melbourne, Australia (May 2016)

\* *Some funded by CRUSER, some by others*

# Data Farming Workshops / Educational Outreach

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## *Upcoming...*

- ½ day tutorial as part of WSC '17 in Las Vegas, NV  
<http://www.wintersim.org>  
**Data Farming 101** (Sunday 3 Dec 2017)
- Initial discussion / resources about data farming for  
**YOUR MODEL** (ongoing)



“Petaflop machines like Roadrunner have the potential to fundamentally alter science and engineering...[allowing scientists to] perform experiments that would previously have been impractical.” *The New York Times, June 9, 2008*

Designed experiments yield “better data, not just big data”

# questions?

<http://harvest.nps.edu>